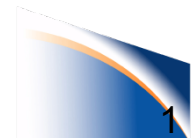


# **Turbulence forecasting for boundary layer turbulence**

Weather and Unmanned Aircraft Systems (UAS) Management  
Workshop (UTM) July 19-21, 2016  
NASA Ames Conference Center  
Moffett Field, CA

Bob Sharman and Domingo Muñoz-Esparza  
National Center for Atmospheric Research (NCAR)  
Boulder CO



**NCAR**

# Aviation turbulence forecasting

- Goal: Provide operationally useful nowcasts and forecasts of turbulence that is readily available to the aviation community
  - 24 x 7
  - Easy to understand graphical displays
  - Forecasts out at least 6 hrs over US, 12 hrs globally
  - All flight levels from surface to 45,000 ft (~13.7)
  - Meets some minimum statistical performance requirements
  - Focus has been on upper-levels where commercial aircraft are in cruise and passengers/flight attendants are often unbuckled
- But character of upper-level turbulence is different than low-level (boundary layer) turbulence so forecasting strategies (esp. for UAVs) must account for this



# A turbulence diagnostic/forecasting system must account for all sources of turbulence

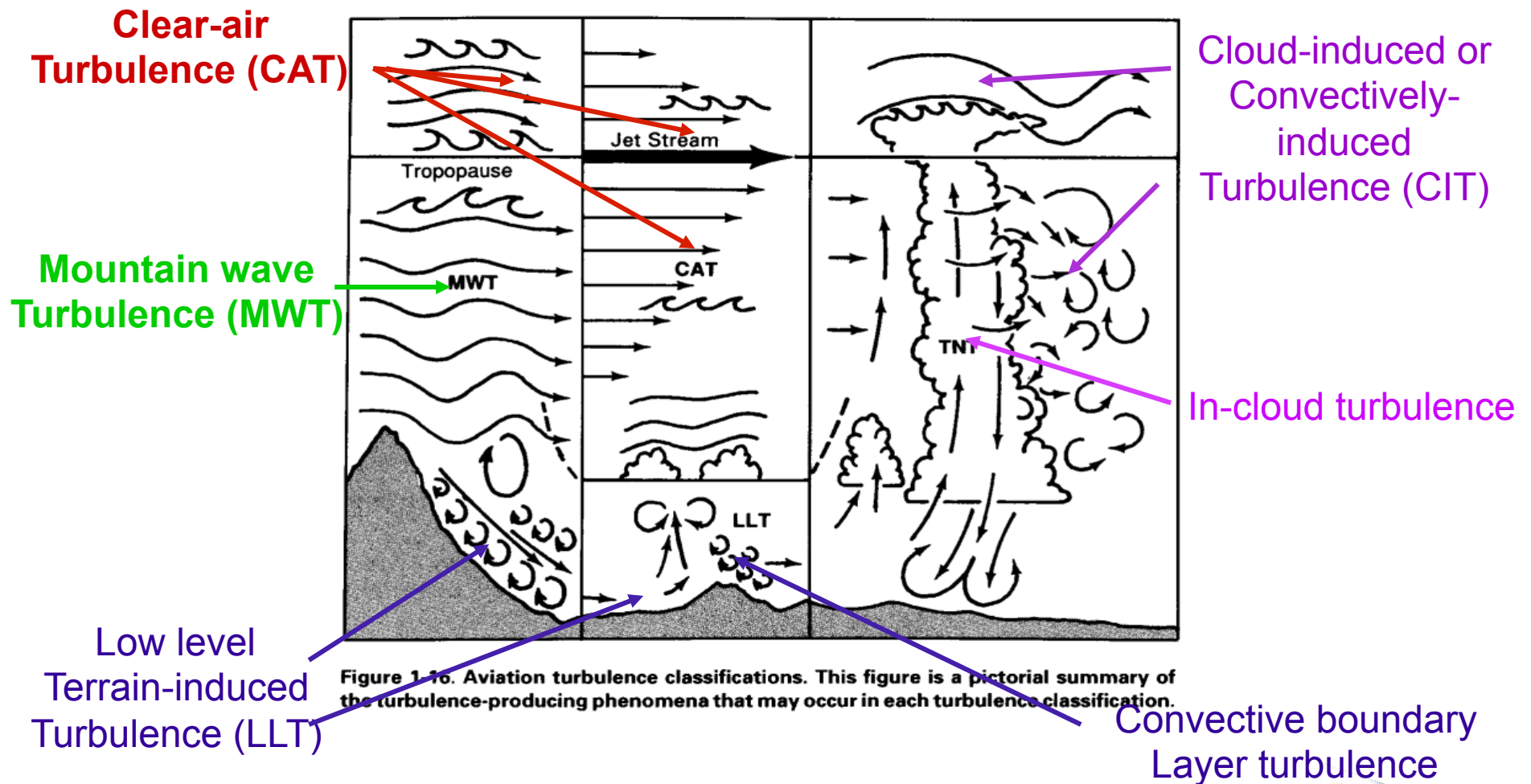


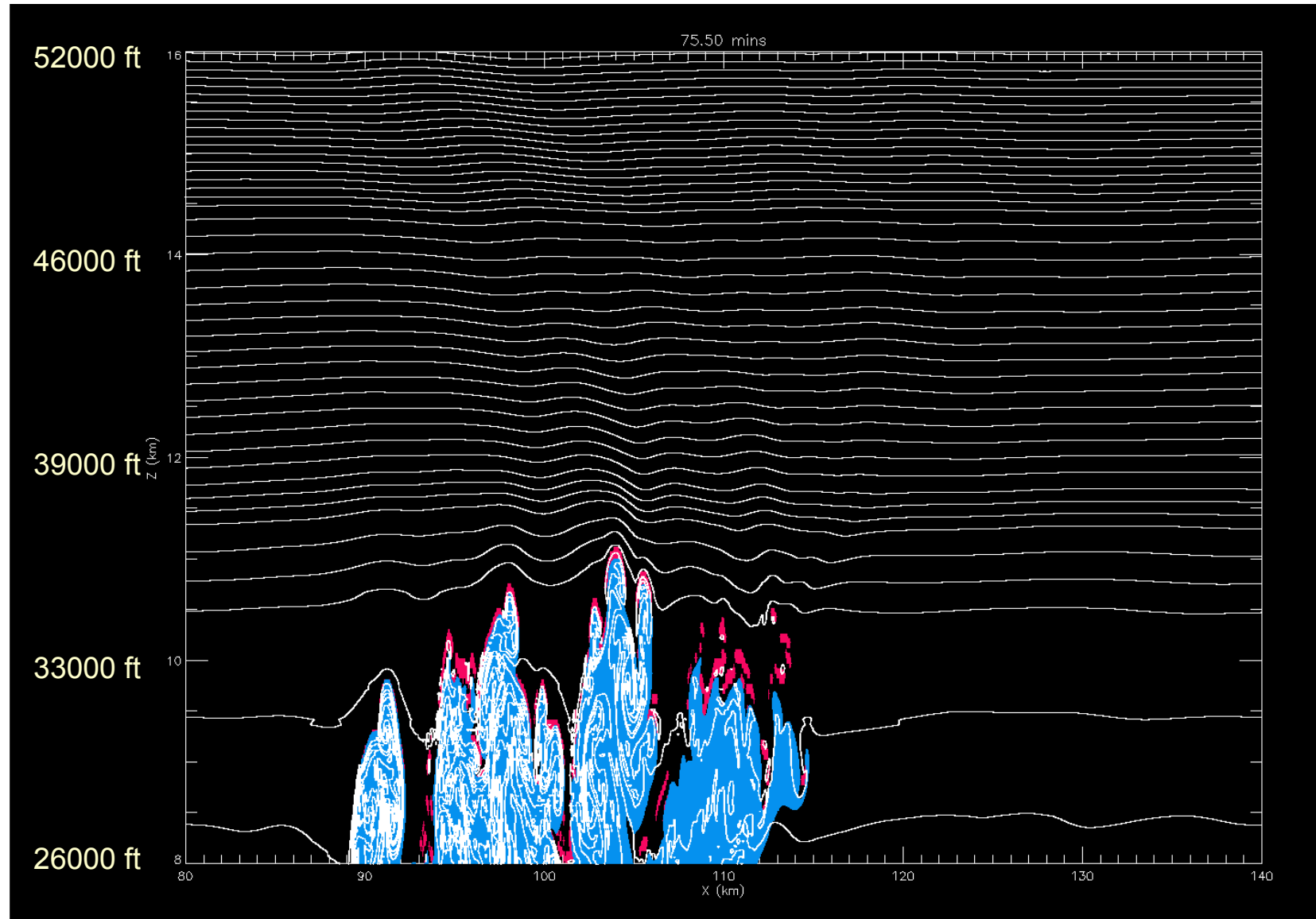
Figure 1-16. Aviation turbulence classifications. This figure is a pictorial summary of the turbulence-producing phenomena that may occur in each turbulence classification.

Source: P. Lester, "Turbulence – A new perspective for pilots," Jeppesen, 1994



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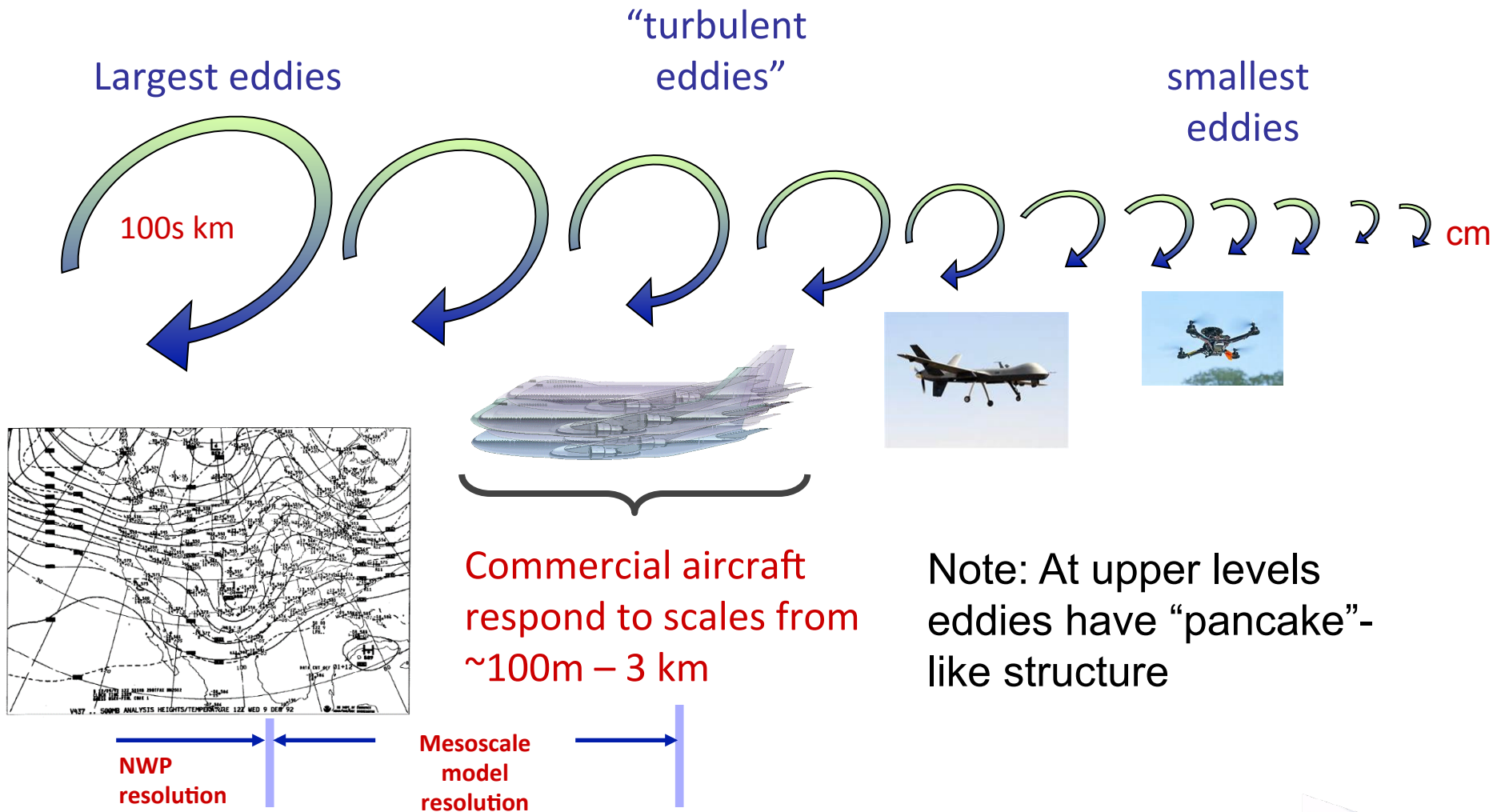
## Numerical Simulation: Breaking Internal Gravity Waves and CIT



2-D simulation showing cloud, gravity waves, and turbulence (courtesy of Todd Lane)

Lane, Sharman, Clark, and Hsu (J. Atmos. Sci. 20

# Background - Scales of aircraft turbulence



# Approach

- No option to directly forecast globally at say 25 m grid spacing
- Since must be operational, must use operational NWP model (e.g., WRF-RAP, HRRR, GFS)
- Available NWP turbulence parameterizations don't work very well, esp. at upper-levels
- Instead, compute “turbulence diagnostics” (D) from NWP output
- Assumes linkage between NWP resolvable scales and aircraft turbulence scales
- Ds are typically related to model spatial variations

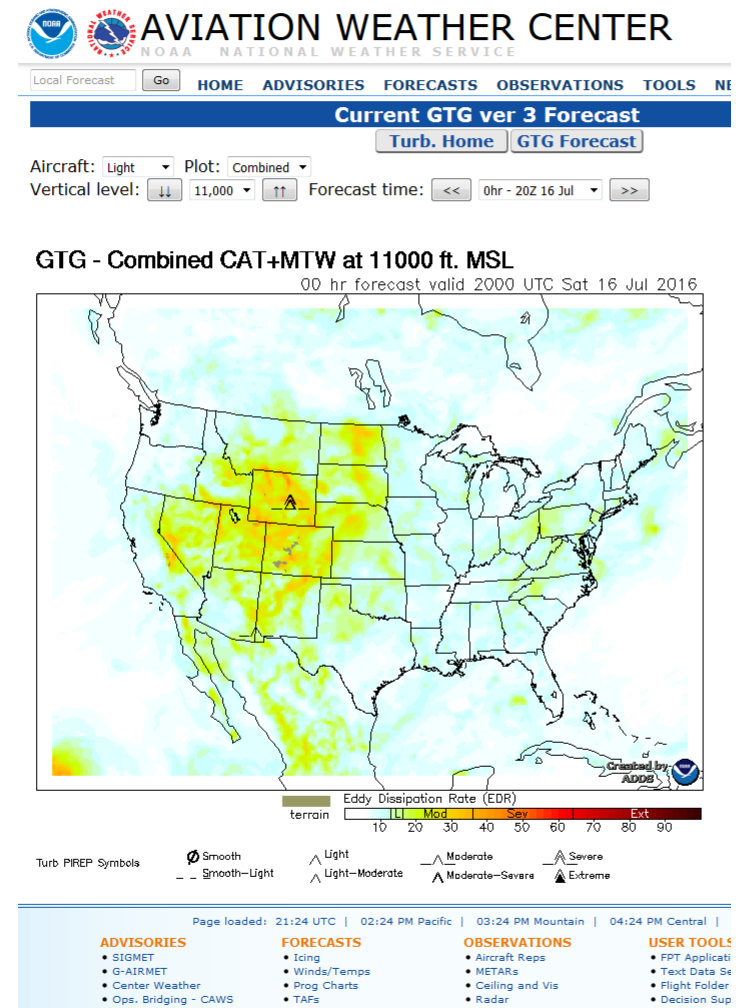


# Turbulence Forecasting: Automated Approach\*

- Forecast system is called the Graphical Turbulence Guidance (GTG)\*
  - Supported by FAA AWRP
  - Currently operational and available 24x7 on Operational ADDS ( <http://aviationweather.gov/adds> )
  - Uses WRF-RAP NWP model
  - Updated hourly
- Computes suite of turbulence diagnostics (D)
- Scale each diagnostic to common intensity measure (D\*)
- GTG = ensemble weighted mean

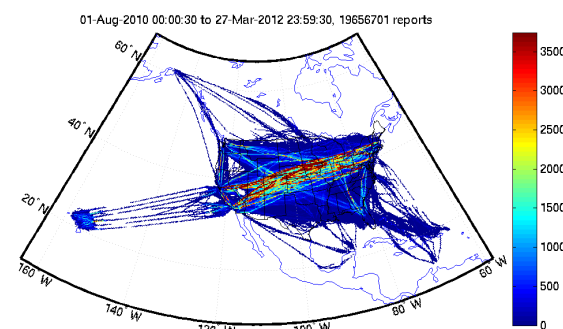
$$GTG = W_1 D_1^* + W_2 D_2^* + W_3 D_3^* + \dots$$

- Ws and Ds are turbulence source and altitude dependent



# But what are we forecasting?

- “Aircraft scale” eddies that affect aircraft
- Aircraft response is aircraft dependent: “light”, “moderate”, “severe”
- CANNOT forecast these levels for every aircraft in the airspace
- Instead need atmospheric turbulence measure (i.e. aircraft independent measure)
  - We forecast EDR ( $= \epsilon^{1/3} \text{ m}^{2/3}\text{s}^{-1}$ )
    - Convenient 0-1 scale
    - ICAO standard
      - EDR thresholds for mid-sized aircraft are  $\sim 0.10, 0.3, 0.5$  for “light”, “moderate”, “severe”, resp.
    - Can relate to aircraft loads ( $\sigma_g \sim \epsilon^{1/3}$ )
    - Can be compared to in situ EDR estimates onboard some commercial aircraft ( $\sim 400$ )



UAL B757 insitu EDR  
Reports  $\sim 1.5$  yrs



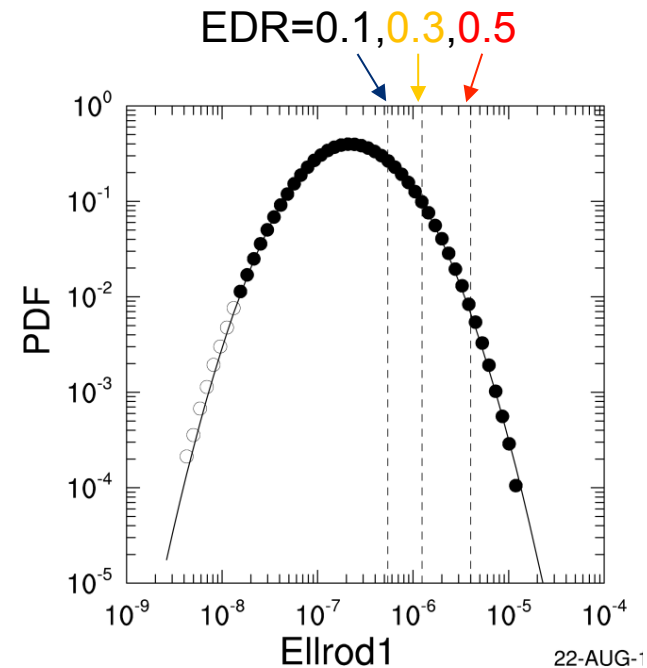


# Conversion of diagnostics to EDR

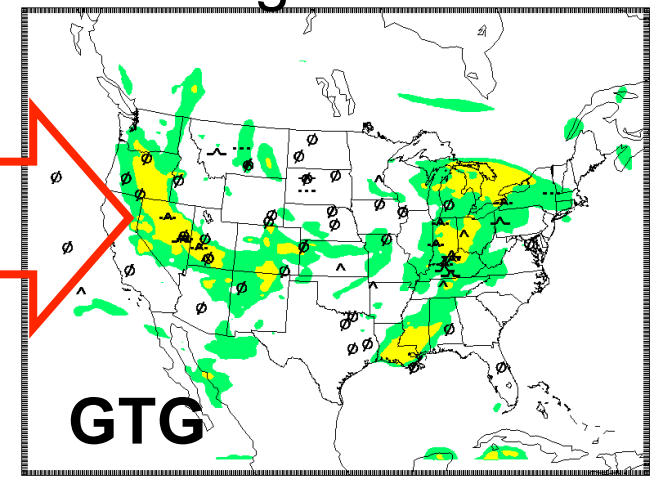
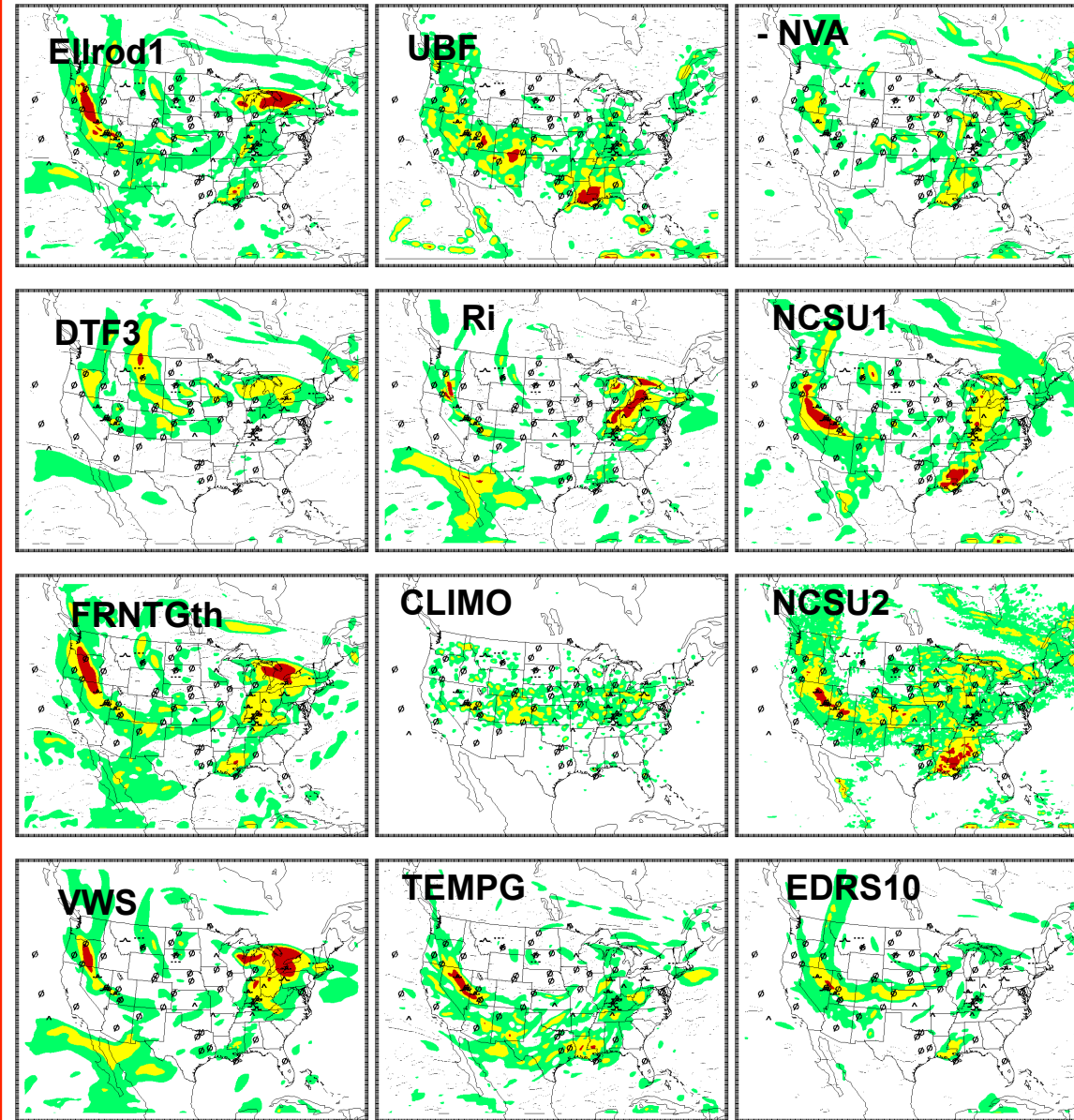
- Each  $D$  is rescaled to an EDR assuming a log-normal distribution of  $\text{edr}$

$$\log D^* = a + b \log D$$

- Where  $a$  and  $b$  are chosen to give best fit to expected log-normal distribution and depend on climatology
- Can then combine
$$\text{GTG (EDR)} = W_1 D_1^* + W_2 D_2^* + W_3 D_3^* + \dots$$
- Tune to get the best set of diagnostics and weights based on comparisons to observations

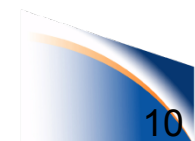


**Final Step:**  
Produce Weighted  
ensemble of  
turbulence  
diagnostics



0 h forecast valid at 22 Sep 2006 15Z

8/25/16



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# GTG tuning

- GTG produces EDR which is supposed to be aircraft independent
- But selection of diagnostics and weights depends on comparisons to observations
  - These observations are mainly available at upper levels not in the boundary layer
  - The observations are from relatively large aircraft (compared to UAVs)
  - The PBL contains different source/types of turbulence
- So GTG has not been designed/optimized for PBL turbulence and a modified approach is required to better support UAV operations
  - Use verified LES to test diagnostics most suitable for GTG PBL forecasts
  - Domingo...



# Upper-level vs. ABL turbulence

## Upper-level turbulence

Quasi-two-dimensional in essence

Depends on meteorology

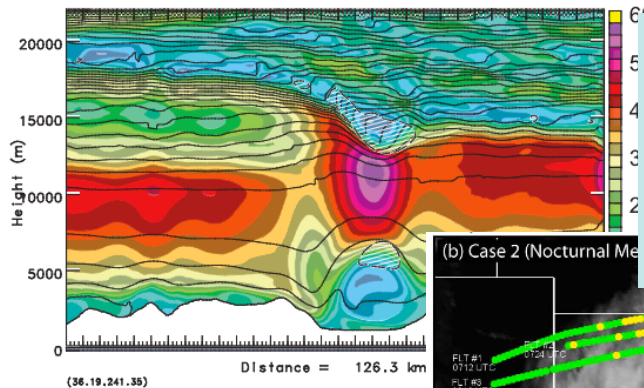
- Strong wind shear (jet streams, upper-level fronts), mountain waves, near-cloud turbulence [*Clear-Air Turbulence*]
- Thunderstorms and clouds

## ABL turbulence

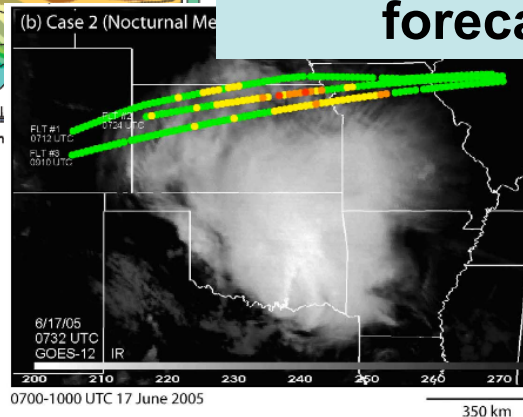
Three-dimensional

ALWAYS present

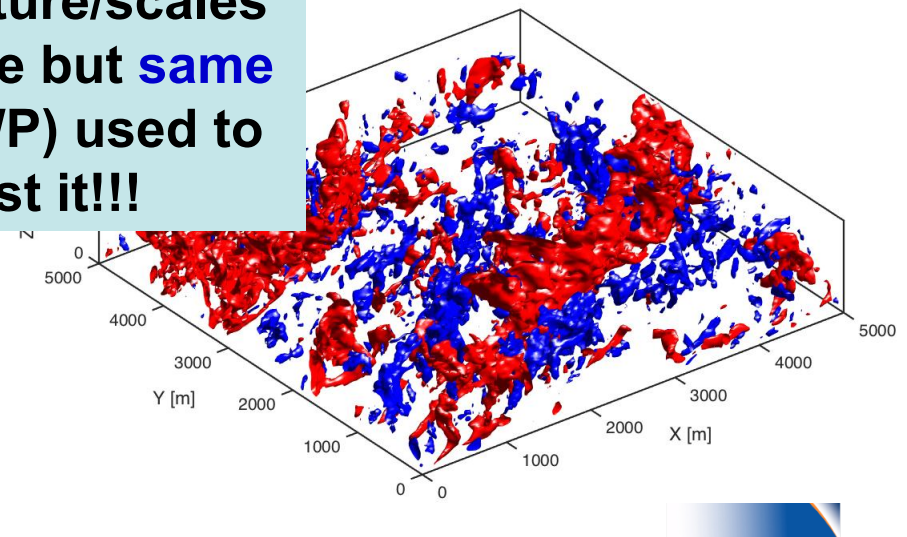
- Surface friction
- Stronger during day than nighttime
- Decreases with height
- Enhanced by complex terrain & other heterogeneities (e.g. buildings)



Examples taken from  
Sharman et al. GRL2012

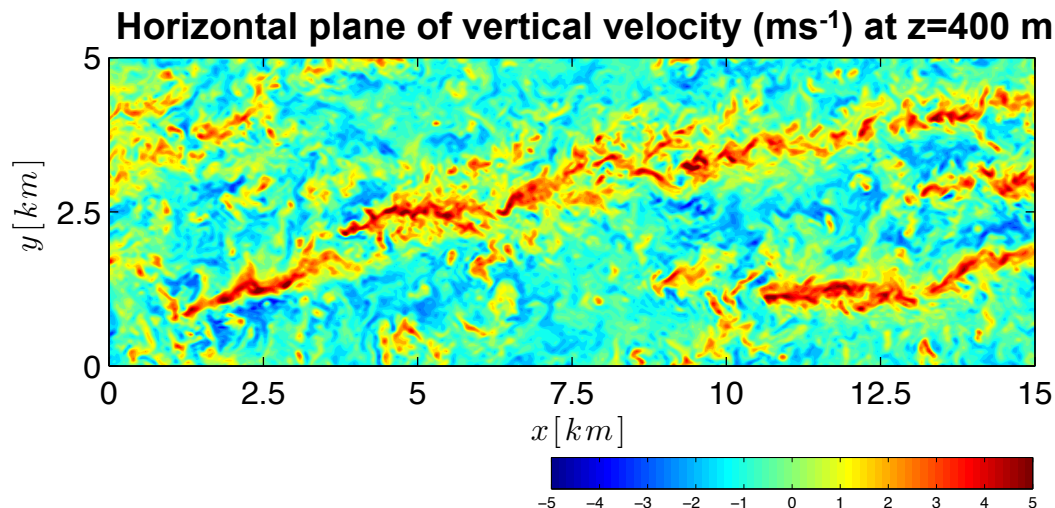


**Different** nature/scales  
of turbulence but **same**  
models (NWP) used to  
forecast it!!!



# “Idealized” ABL with large-eddy simulations

- Atmospheric state influences turbulence levels in the ABL
- Forecast deviations will introduce errors in turbulence estimations that are very difficult to quantify
- Use “idealized” large-eddy simulation (LES,  $\Delta x=20\text{m}$ ) -> “reference” ABL



## Simulation details

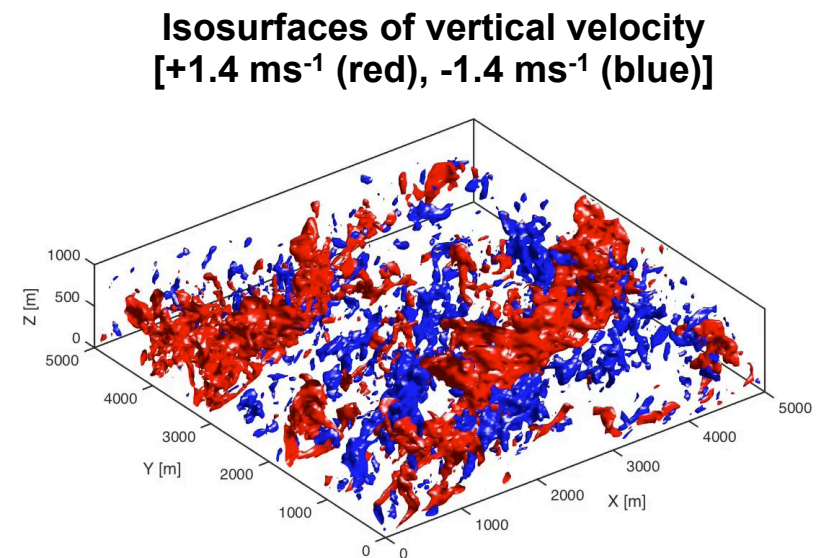
15 km x 15 km x 2 km (3D domain)

Flat terrain

Constant heating of  $83\text{ Wm}^{-2}$

Constant geostrophic wind of  $20\text{ ms}^{-1}$

(Controlled ABL)

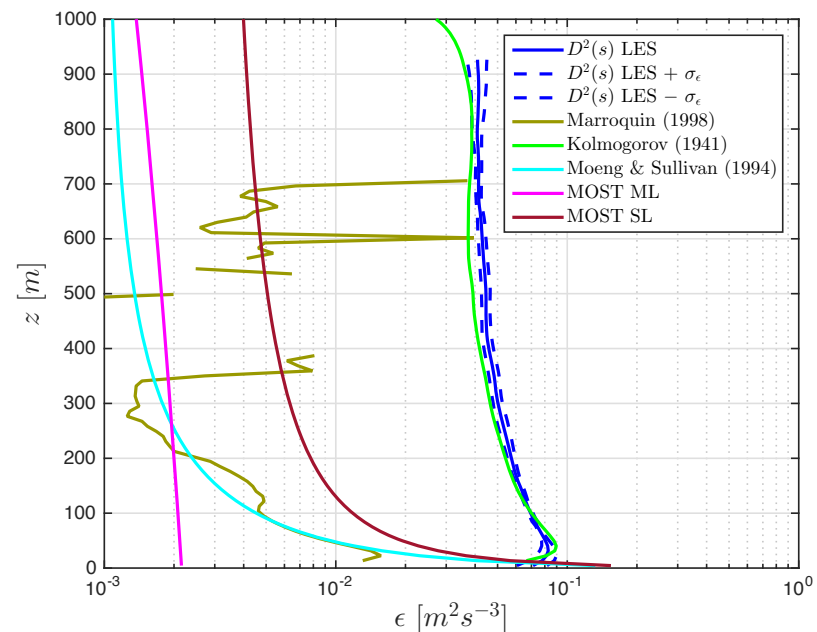
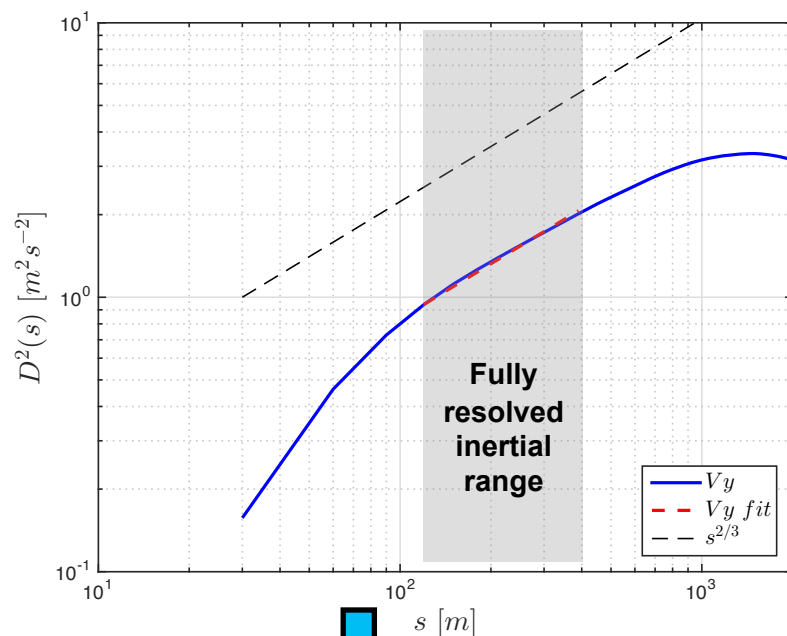


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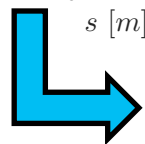


# “Idealized” ABL with large-eddy simulations

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- Use “idealized” large-eddy simulation (LES,  $\Delta x=20\text{m}$ ) -> “reference” ABL
  - Resolved turbulence from the LES provides “true” measurements
  - “Exact” NWP forecast -> horizontally-averaged LES (velocity, TKE, temperature,...)



Kolmogorov (1941)



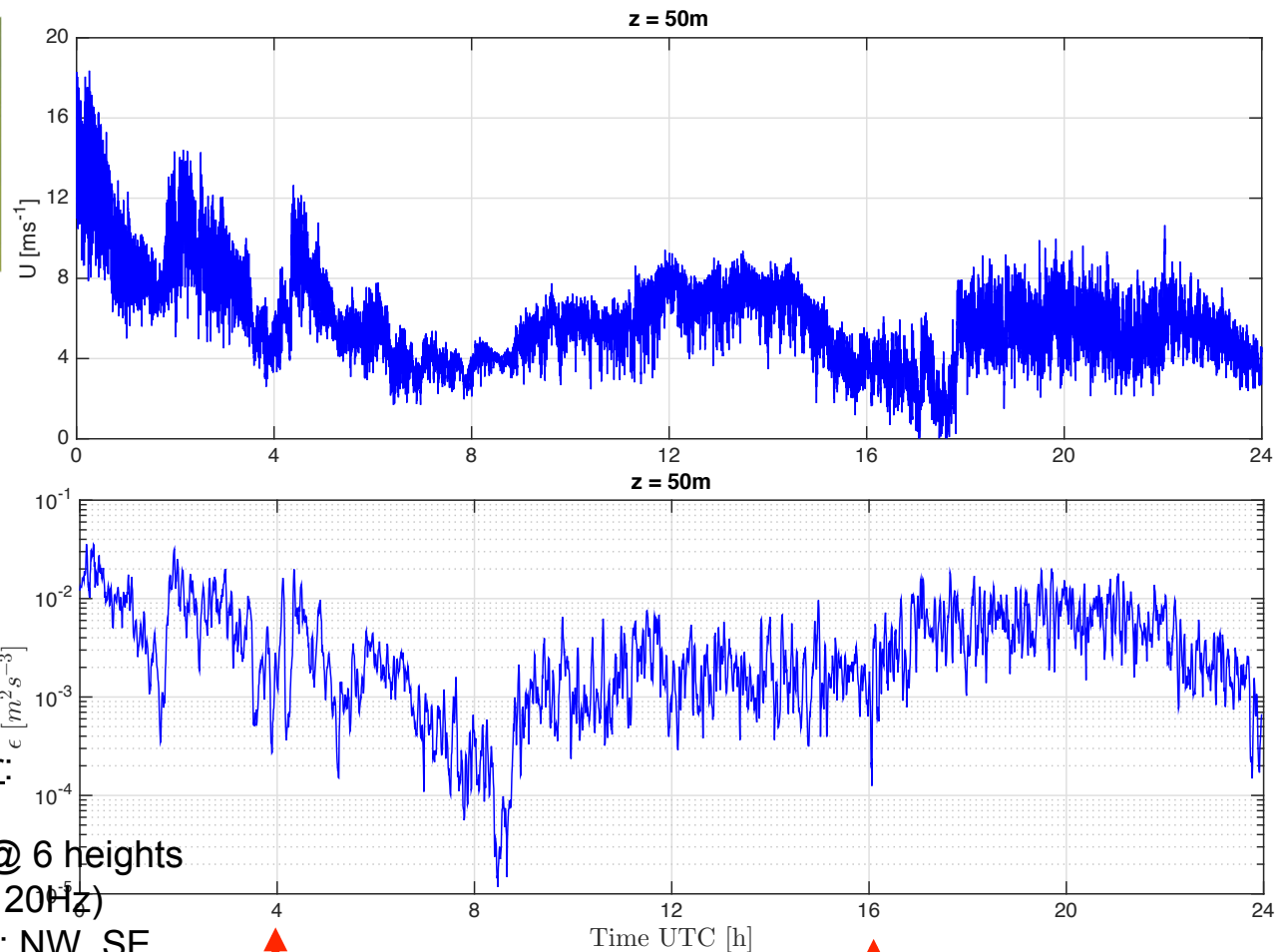
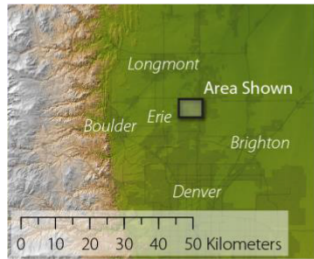
$$D^2(s) = C_K \epsilon^{2/3} s^{2/3}$$



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# “Real” ABLs: the XPIA field campaign

- The eXperimental Planetary boundary layer Instrumentation Assessment campaign took place in March-May 2015 near Boulder, CO (Lundquist et al. 2016)



BAO tower:  
300 m tall

Sonic anemometers @ 6 heights  
(z=50:50:300m, 20Hz)

2 sonics per height: NW, SE

Additional small tower near by  
(sonic @ z=5m, 10Hz)

10 pm

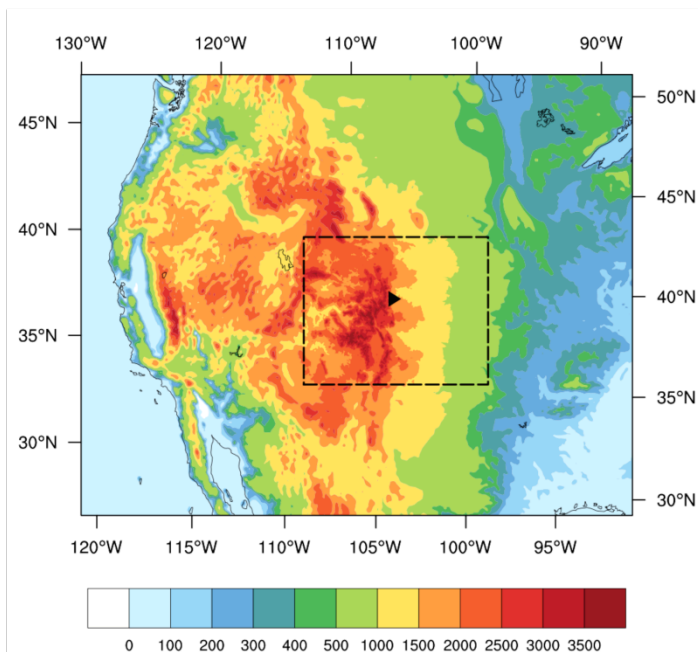
10 am



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# Forecasting EDRs within the ABL

- We are conducting WRF mesoscale simulations (6 configurations) to compare forecasted EDRs to BAO tower observed turbulence (1 month period, March 2015)



Domain1:  $dx=dy=9\text{km}$

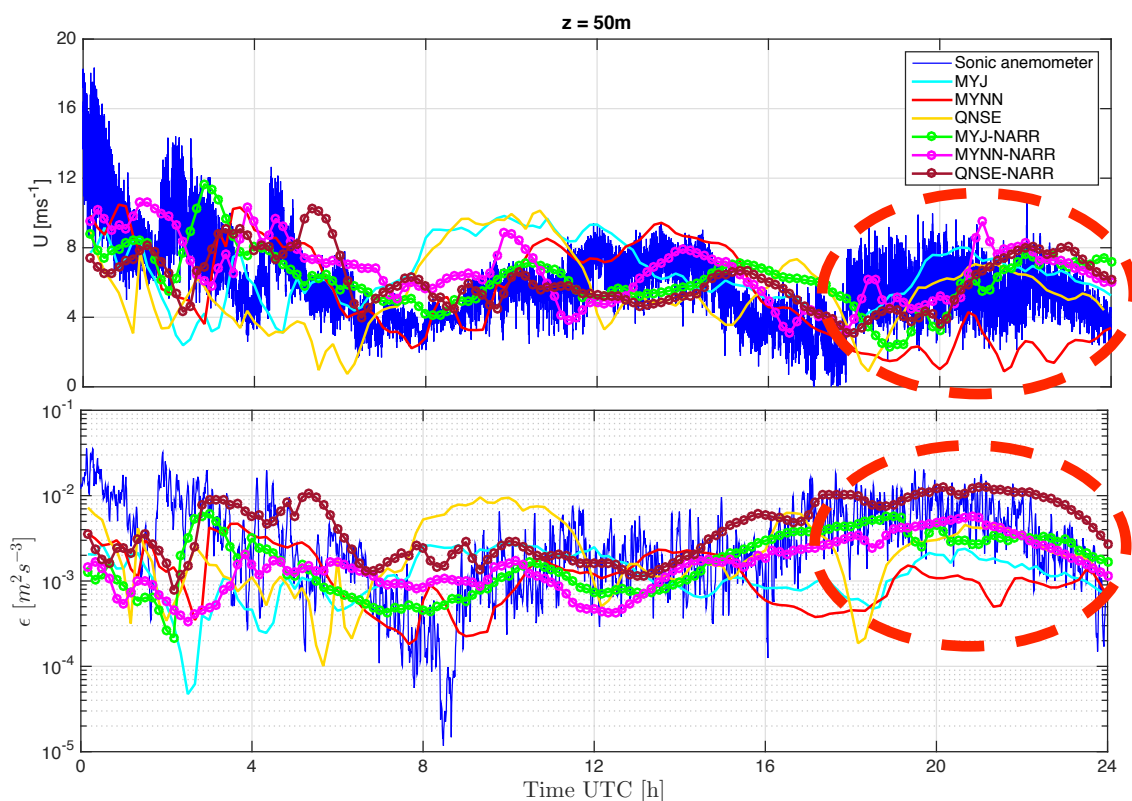
Domain2:  $dx=dy=3\text{km}$

Vertical grid: 73 levels

(40 levels within first 2 km AGL)

3 PBL schemes

2 reanalysis



**For UAVs to fly beyond line of sight ->**  
**forecast verification should go beyond wind speed**  
**(ABL structure, stability, terrain...)**



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# Forecasting EDRs within the ABL

“Idealized” LES has allowed us to identify the best diagnosing criteria to estimate EDRs within the CBL (daytime conditions)

## Current and future work

- Analyze NWP model derived EDRs to parameterization of ABL turbulence and reanalysis
- What is the interplay between stability, wind & terrain effects?
- Do the models capture it correctly?
- Implement this approach to forecast ABL EDRs in the GTG algorithm for operational purposes
- Testing of GTG-ABL using HRRR data for XPIA campaign
- Improvements/optimizations to the GTG-ABL algorithm

